

Medical Errors Involving Trainees

A Study of Closed Malpractice Claims From 5 Insurers

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Background: Despite wide recognition that the delivery of medical care by trainees involves special risks, information about the types and causes of medical errors involving trainees is limited. To describe the characteristics of and factors contributing to trainee errors, we analyzed malpractice claims in which trainees were judged to have played an important role in harmful errors.

Methods: The claims were closed between 1984 and 2004, and the errors occurred between 1979 and 2001. Specialist physicians reviewed random samples of closed malpractice claim files at 5 liability insurers from 2002 to 2004 and determined whether injuries had occurred, and if so, whether they were due to error. We described the clinical circumstances and contributing factors associated with harmful errors involving trainees ("cases"). We also compared the characteristics of cases with their nontrainee counterparts and probed trainee errors attributed to teamwork problems and lack of technical competence or knowledge.

Results: Among 240 cases, errors in judgment (173 of 240 [72%]), teamwork breakdowns (167 of 240 [70%]), and lack of technical competence (139 of 240 [58%]) were the most prevalent contributing factors. Lack of supervision and handoff problems were most prevalent types of teamwork problems, and both were disproportionately more common among errors that involved trainees than those that did not (respectively, 54% vs 7% [$P < .001$] and 20% vs 12% [$P = .009$]). The most common task during which failures of technical competence occurred were diagnostic decision making and monitoring of the patient or situation. Trainee errors appeared more complex than nontrainee errors (mean of 3.8 contributing factors vs 2.5 [$P < .001$]).

Conclusions: In addition to problems with handoffs, house staff are particularly vulnerable to medical errors owing to teamwork failures, especially lack of supervision. Graduate medical education reform should focus on strengthening these aspects of training.

Arch Intern Med. 2007;167(19):2030-0

GRADUATE MEDICAL EDUCATION poses unique challenges for the delivery of safe patient care,¹⁻³ and medical trainees face special risks of involvement in medical errors.⁴⁻¹⁰ This is predictable: trainees are inexperienced, often fatigued, and occasionally unsupervised, and the academic medical centers in which they work are typically large and complex facilities charged with treating the sickest patients. Despite recognition of these risk factors, information about the types and causes of trainee errors is limited.⁸ This knowledge gap inhibits the design of effective prevention strategies, such as targeted educational programs and system changes to reduce trainee errors and advance patient safety.¹¹ An improved understanding of the causes of trainee errors could help guide the implementation

of the Accreditation Council for Graduate Medical Education's (ACGME) core competencies into residency curricula in directions that advance patient safety.²

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The Malpractice Insurers Medical Error Prevention Study (MIMEPS), a review of 1452 malpractice claims from 5 insurers, provided us with a valuable opportunity to investigate trainee involvement in medical errors.¹² We conducted a subanalysis of the MIMEPS claims in which study reviewers detected harmful errors and judged that 1 or more interns, residents, or fellows played an important causal role. Our main goals were to describe the characteristics of these "trainee errors" and identify their contributing factors. We an-

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anticipated that problems of technical competence, handoff,¹³ and other aspects of teamwork¹⁴ would figure prominently, so we explored these areas in depth.

METHODS

STUDY SITES

Five malpractice insurance companies in 4 regions (northeastern, mid-Atlantic, southwestern, and western United States) participated in the study. The companies covered approximately 33 000 physicians, 61 acute care hospitals (35 academic and 26 nonacademic), and 428 outpatient facilities. The study was approved by ethics review boards at the investigators' institutions and by the review sites.

CLAIMS SAMPLE

Data were extracted from random samples of closed claim files at each insurer in on-site reviews conducted between 2002 and 2004. The claim file is the repository of information accumulated by the insurer during the life of a claim. While the claim is open, it includes medical records pertaining to the episode of care at issue. For all sampled claims, we reacquired the relevant medical records from insured institutions.

We defined a claim as a written demand for compensation for medical injury.^{15,16} We focused on 4 clinical categories—(1) obstetric, (2) surgical, (3) missed and delayed diagnoses, and (4) medication—and applied a uniform definition of each across sites. These categories cover approximately 80% of all medical malpractice claims filed in the United States.^{17,18} Insurers contributed to the study sample in proportion to their annual claims volume. The number of claims by site varied from 84 to 662 (median, 294).

STUDY INSTRUMENTS AND CLAIM FILE REVIEW

Reviewers were board-certified attending physicians, fellows, or final-year residents in surgery (surgical claims), obstetrics (obstetric claims), and internal medicine (diagnosis and medication claims). Physician investigators from the relevant specialties trained the reviewers in the content of claims files, use of the study instruments, and confidentiality procedures in 1-day sessions at each site. Reviews took a mean of 1.6 hours per file and were conducted by 1 reviewer.

A sequence of 4 instruments guided the review. The review process has been described in detail in previous publications.^{12,19} In summary, reviewers made an initial judgment about whether an adverse outcome had occurred, and if it did, they scored the outcome on a severity scale ranging from emotional injury to death.²⁰ For claims with identifiable adverse outcomes, reviewers proceeded to consider the potential contributory role of 17 possible contributory factors in causing the adverse outcome. Next, they judged whether the adverse outcome was due to medical error, defined as "the failure of a planned action to be completed as intended (i.e., error of execution) or the use of a wrong plan to achieve an aim (ie, error of planning)."²¹ Reviewers' confidence in the error judgments was recorded on a 6-point scale ranging from 1 (little or no evidence that adverse outcome resulted from error/errors) to 6 (virtually certain evidence that adverse outcome resulted from error/errors).^{22,23} Claims that scored 4 (more likely than not that an adverse outcome resulted from error/errors; more than 50-50 but a close call) or higher were classified as involving an error. Finally, for the subset of claims judged to involve an adverse outcome due to error, reviewers gathered details of the clinical circumstances, includ-

ing the specialty of involved clinicians and their contributory role as rated on a 5-point scale (1, somewhat important, to 5, highly important).

To test the reliability of the claims file review, 10% of the files were rereviewed by a second physician from the relevant specialty who was unaware of the first review. On the basis of 148 pairs of reviews, κ scores were 0.78 (95% confidence interval, 0.65-0.90) for the determination of injury and 0.63 (95% confidence interval, 0.12-0.74) for the judgment that error occurred. More detailed results of the reliability testing are reported elsewhere.^{12,19,24}

TRAINEE SAMPLE

The unit of analysis in MIMEPS was the episode of care in claims judged to involve errors that led to an adverse outcome. For ease of exposition, we henceforth refer to such episodes as "cases." For this study, we drew a subsample of cases from the full sample of cases identified in MIMEPS ($n=889$). The subsample consisted of cases in which the reviewer had rated the contributory role of a medical student, intern, resident, or fellow at 4 or 5 or rated it 3 and no other involved clinician had a higher rating. Reliability testing for the determination that 1 or more trainees were involved, which was based on 47 pairs of original reviews, showed good agreement (89% agreement; $\kappa=0.64$ [95% confidence interval, 0.34-0.94]).

STATISTICAL ANALYSIS

Analyses were conducted using the Stata/SE 8.0 (StataCorp, College Station, Texas) software package. We generated descriptive statistics to examine the characteristics of the trainees, patients, and adverse outcomes in the study sample. We compared the frequency with which contributing factors were associated with trainee errors vs nontrainee errors using Fisher exact tests.

We conducted an in-depth analysis of cases involving problems of teamwork and technical competence, respectively. With respect to teamwork problems, we investigated the personnel relationships in which they occurred. Cases with teamwork problems were defined as those in which the original reviewer had judged that 1 or more of the following contributory factors played a role in the error: communication breakdowns, supervision problems, handoff problems, failures to establish clear lines of responsibility, and conflict among clinical staff. Defining teamwork according to such behaviors is consistent with previous conceptualizations of teamwork in medicine²⁵ and the World Health Organization's definition of the term.²⁶

For problems of technical competence or knowledge, we identified the task being performed by the physician when the error occurred. The task options were drawn from a list of categories of general practitioner tasks provided by the Occupational Information Network,²⁷ which are general enough to adequately capture the work of clinicians in a range of specialties. We made several modifications to the Occupational Information Network list. Specifically, we split 1 of the categories ("specialized medical care to treat or prevent illness, disease, or injury") into nonprocedural and procedural work, and then further divided the latter into procedures that were related to obstetrical deliveries and those that were not.

RESULTS

Of 889 cases (claims with both error and injury) identified in the parent study, 240 (27%) involved trainees whose role in the error was judged to be at least moderately important. The claims were closed between 1984

Table 1. Characteristics of Trainees, Patients, and Adverse Outcomes in 240 Trainee Errors

Characteristic	No. (%) ^a
Trainees	
Residents	208 (87)
Interns	31 (13)
Fellows	30 (13)
Patients	
Female	121 (51)
Age, mean, y	30
< 1	61 (25)
1-17	23 (10)
18-34	54 (23)
35-49	52 (22)
50-64	30 (12)
> 64	20 (8)
Health insurance ^b	
Private	46 (36)
Medicaid	32 (25)
Uninsured	31 (24)
Medicare	11 (9)
Other	8 (6)
Adverse outcomes	
Type	
Breach of informed consent	1 (< 1)
Psychological or emotional	3 (1)
Minor physical	29 (12)
Significant physical	79 (33)
Major physical	48 (20)
Death	80 (33)
Location	
Inpatient	168 (70)
Outpatient	72 (30)
Clinical area	
Operative	77 (32)
Obstetrics	73 (30)
Missed or delayed diagnosis	51 (21)
Medication	39 (16)

^aPercentages do not sum to 100% because multiple providers were involved in some errors.

^bPatient's health insurance was missing in 112 claims (46%). Percentages were calculated using nonmissing observations as the denominator.

and 2004 and the errors occurred between 1979 and 2001; 72% of the claims were closed in 1990 or later.

SAMPLE CHARACTERISTICS

Table 1 gives the characteristics of trainees, patients, and adverse outcomes in the study sample. The mean age of injured patients was 30 years, and 51% were female. Residents were involved in 87% of the cases. The adverse outcomes were generally severe: one-third resulted in significant physical injury, one-fifth in major physical injury, and an additional third in death. Nearly a third (30%) of the cases occurred in the outpatient setting.

One-third of the cases involved trainees in obstetrics and gynecology (**Table 2**). The next most prevalent specialties were general surgery, adult primary care, orthopedic surgery, and pediatrics. Collectively, 78% of the cases involved trainees from 1 or more of these 5 specialties.

Characteristics of the parent study sample have been reported elsewhere.¹² The 240 trainee errors differed from

Table 2. Specialty of Trainees Involved in Errors

Specialty	Cases, No. (%) ^a
Obstetrics-gynecology	80 (33)
General surgery	45 (19)
Adult primary care	28 (12)
Orthopedic surgery	19 (8)
Pediatrics	14 (6)
Anesthesiology	13 (5)
Emergency medicine	11 (5)
Neurosurgery	9 (4)
Plastic surgery	6 (3)
Radiology	5 (2)
Urology	5 (2)
Medical student	4 (2)
Cardiology	3 (1)
Hematology or oncology	3 (1)
Neurology	3 (1)
Cardiothoracic surgery	3 (1)
Ophthalmology	3 (1)
Infectious disease	2 (1)
Physical medicine or rehabilitation	2 (1)
Ear, nose, and throat	2 (1)
Vascular surgery	2 (1)
Psychiatry	1 (< 1)

^aPercentages do not sum to 100% because multiple providers were involved in some errors.

their 649 nontrainee counterparts on several measures. A larger proportion of trainee errors occurred during inpatient care (70% vs 52% [$P < .001$]). Patients injured in trainee errors were younger on average (30 years vs 38 years [$P < .001$]) and more likely to sustain fatal injury (33% vs 24% [$P = .008$]). In addition, a larger proportion of trainee errors involved obstetrics events (30% vs 21% [$P = .003$]) and fewer involved missed or delayed diagnosis (21% vs 32% [$P = .002$]).

CONTRIBUTING FACTORS

Cognitive factors contributed to nearly all of the trainee errors, with 72% of cases involving judgment errors and 57% involving failures of vigilance or memory (**Table 3**). Fifty-eight percent of the cases involved lack of technical competence or knowledge and 70% involved teamwork-related factors. The most prevalent types of teamwork factors were lack of supervision and handoffs.

Eight contributing factors were significantly more prevalent among trainee cases than nontrainee cases (Table 3). Lack of technical competence (58% vs 42% [$P < .001$]), lack of supervision (54% vs 7% [$P < .001$]), handoff problems (19% vs 13% [$P = .02$]), and excessive workload (19% vs 5% [$P < .001$]) were particularly noteworthy contributing factors in the comparison, both because the differences were large and because these contributing factors were prevalent within the trainee group. At the aggregate level, teamwork factors contributed to 70% of trainee errors, more than twice the frequency with which they contributed to errors ($P < .001$).

The trainee errors involved a mean of 3.9 contributing factors, compared with a mean of 2.7 factors among

Table 3. Factors Contributing to Trainee and Nontrainee Errors

Contributing Factors	Cases, No. (%)		P Value (2-sided) ^a
	Trainee (n=240)	Nontrainee (n=649)	
Cognitive factors	227 (95)	598 (92)	.24
Error in judgment	173 (72)	451 (69)	.51
Failure of vigilance or memory	137 (57)	375 (58)	.88
Lack of technical competence or knowledge	139 (58)	270 (42)	< .001
System factors	180 (75)	243 (37)	< .001
Teamwork factors	167 (70)	187 (29)	< .001
Lack of supervision	129 (54)	46 (7)	< .001
Handoff problems	46 (19)	83 (13)	.02
Other communication problem	39 (16)	77 (12)	.09
Lack of clear lines of responsibility	34 (14)	53 (8)	.01
Conflict among personnel	5 (2)	12 (2)	.79
Other factors			
Excessive workload or inadequate staffing	46 (19)	31 (5)	< .001
Interruptions or distractions	25 (10)	33 (5)	.006
Technology failure	14 (6)	53 (8)	.32
Fatigue	12 (5)	6 (1)	< .001
Ergonomic failure (eg, lighting and setup)	5 (2)	5 (1)	.14
Patient-related factors	104 (43)	242 (37)	.10

^aP values from Fisher exact tests for differences between trainees and nontrainees are given.

nontrainee errors. The difference was significant ($P < .001$) and suggested greater causal complexity associated with the errors in the trainee group.

Because our sample covered a 22-year period, we also tested for secular trends in the frequency of the contributing factors among trainee errors. When events that occurred in 1993 (the median occurrence year) or earlier were compared with those that occurred in later years, one significant difference emerged: a larger proportion of events from the earlier period involved supervision problems (80 of 128 [61%] vs 51 of 112 [47%]; $P = .01$).

LACK OF SUPERVISION AND HANDOFF PROBLEMS

In 82% (106 of 129) of the cases involving lack of supervision, attending physicians' failure to supervise residents was at issue; in 12% (16 of 129) of the cases, supervision failures by both senior residents and attending physicians were apparent (**Table 4**). Handoff problems occurred most commonly in handoffs between trainees (19 of 56 [34%]) and between trainees and attending physicians (18 of 56 [32%]). Four cases were related to poor communication over the telephone between the trainee and the attending physician. In

Table 4. Personnel Involved in Failures of Supervision and Handoff Problems

Team Characteristic	No. (%)
Failure of supervision (n=129) occurred when trainee supervised by	
Attending physician(s)	106 (82)
Senior resident and attending physician	16 (12)
Senior resident	1 (1)
Undetermined	6 (5)
Handoff problem (n=56) involved transfer of information ^a	
Trainee to trainee	19 (34)
Trainee to attending physician	18 (32)
Trainee to nurse	8 (14)
Trainee to pharmacy or laboratory	3 (5)
Trainee to outside personnel or entity	3 (5)
Undetermined	5 (9)

^aSubcategories sum to more than 56 because some cases involved multiple handoffs. In 5 claims, the handoff did not involve a trainee (3 were nurse to nurse handoffs, and 2 were attending to attending handoffs). The explanation for such situations in the study sample is that a typical claim had multiple contributing factors, and the trainee involvement pertained to another factor.

Table 5. Primary Task in Which the Trainee Lacked Technical Competence or Knowledge

Primary Task at Hand ^a	Cases, No. (%) (n=139)
Diagnosis	67 (48)
Performing procedures unrelated to deliveries	29 (21)
Prescribing or administering treatment (other than procedures)	21 (15)
Performing procedures related to deliveries	8 (6)
Evaluation	4 (3)
Consultation with other health care personnel	4 (3)
Monitoring	3 (2)
Informing and/or counseling patients	3 (2)

^aThree additional categories from the tasks listed on the occupational practitioner checklist are not included in the table, either because none of the errors of lack of technical competence or knowledge involved them as the primary task at hand or because they are captured in the adapted categories listed in the table.

general, the chains of communication within which these breakdowns occurred were complex. Approximately a fifth (12 of 56) of handoff problems involved more than 2 entities, and a quarter (14 of 56) of the chains extended to interactions with nurses, pharmacy and laboratory personnel, and entities external to the trainee's home institution.

LACK OF TECHNICAL COMPETENCE OR KNOWLEDGE

Diagnostic decision making was the primary task at hand in nearly half (67 of 139 [48%]) of cases in which technical competence or knowledge problems occurred (**Table 5**). For example, in one case, a surgical resident missed the diagnosis of a bile leak following abdominal

surgery; in another case, an obstetric resident misdiagnosed a breech presentation.

Forty-three percent of cases (60 of 139) had secondary tasks associated with the technical competence problem and 17% (24 of 139) had tertiary tasks (mean of 1.6 tasks per problem). For example, one resident's failure to diagnose a high-risk pregnancy was accompanied by inadequate fetal heart rate monitoring; in this case, diagnostic decision making was classified as the primary task and monitoring, as a secondary task. Considering all tasks ($n=223$) associated with technical competence breakdowns and not just the primary one, diagnosis remained the most common task (36%), followed by monitoring (17%).

COMMENT

This study of malpractice claims data identified several distinctive features of errors involving trainees. Trainee errors were characterized by frequent teamwork and communication breakdowns, especially failures of supervision and handoffs. They were also disproportionately likely to involve technical failures and problems of excessive workload. Diagnostic decision making and monitoring activities were the most common tasks at hand when trainee errors occurred.

The sample of errors we examined is noteworthy for its scope. Malpractice claims data from multiple insurers are a powerful repository of information on care breakdowns from a diverse range of institutions and physicians. Other studies of trainee error have focused on a single discipline or setting and relied on surveys and interviews.^{4,8,9,28} The chief causes of error identified in this previous work include lack of supervision, handoffs, inexperience and lack of competence in a surgical task, and excessive work hours leading to sleep deprivation and/or fatigue.^{4,8,13,29-31} Our study corroborates and extends these findings. For example, in addition to finding that handoffs between house staff are an important risk factor for preventable adverse events,¹³ we found that similar information transfer problems occur between trainees and other agents in the delivery system, including attending physicians, nurses, pharmacists, laboratories, and institutions external to the home institution of the trainee.

Communication failures among residents may stem from several tensions in teamwork, such as medical hierarchies, role ambiguity, and interpersonal dynamics.²⁸ Our study confirms the relationship of poor teamwork to preventable errors³² and quality of care.³³ Despite ACGME systems-based practice competencies and attention to implementation of a team-based system of care in graduate medical education,³⁴ the development of teamwork and other specific communication skills is probably underemphasized in residency. For instance, we found telephone communication to be problematic in several cases, but this skill has not been evaluated or specifically taught.³⁵ One reason why uptake of teamwork training has been slow may be the current lack of effectiveness of formal teaching programs such as Medical Team Training.^{36,37} Information transfer problems are likely to grow. Implementation of the 80-hour-per-

week work limits has increased both the volume of information transfers and the pressures on clinicians, making error prevention strategies in this area³⁸ more critical than ever. (The errors we studied occurred prior to the introduction of ACGME duty-hour regulation in 2003.)

Better supervision of residents has been flagged as one of the more remediable contributors to substandard care.³⁹ Our data underscore the importance of appropriate supervision. The program requirements of the ACGME place supervision responsibilities squarely on the shoulders of the attending physician of record.⁴⁰ Although existing guidelines state that residents should be supervised, best practices in this area have received little theoretical or experiential evaluation.^{41,42} Moreover, explicit statements about what constitutes adequate supervision are lacking within some specialty areas.⁴³ Nonprocedural work is especially impoverished in this regard, which is problematic because we found supervision breakdowns were no less common there. In addition, 1 in 8 of our cases linked errors by junior residents to poor supervision by senior residents, yet no clear guidelines for resident-to-resident supervision are broadly available. The design of curricula to help residents become better teachers and leaders⁴⁴ should incorporate specific strategies geared to improve supervision skills of residents. The 80-hour-week requirement may create additional challenges to adequate supervision, making the case to advance the field of trainee supervision even more compelling.⁴²

Recognition of the types of tasks most commonly associated with failures of technical competence may also help to shape ACGME competencies in ways that improve patient safety. For example, errors during diagnostic work were prevalent, and educational interventions to reduce these errors could focus on competencies such as medical knowledge and patient care.⁴⁵ Good diagnostic decision making depends on a mix of system factors,⁴⁶ including communication of information between the treating physician, laboratory personnel, and radiologists⁴⁷ and other consultants. Thus, the much needed improvements in this area⁴⁸ could be viewed within the spectrum of 4 different competencies including the ones that relate to systems-based practice and communication skills.

Technical competence problems arose relatively frequently during monitoring activities, a finding that reinforces existing evidence that this type of failure is a troubling source of medical error.^{49,50} Although team training emphasizes skills such as situational awareness to improve monitoring,⁵¹ there is a need for specific instructional strategies to improve technical skills. Both simulation⁵² and use of information technology⁵³ hold promise, as do interventions to bolster and support cognitive skills.⁵⁴

The methodological approach we used to identify trainee errors has a number of advantages over previously used approaches, such as surveys. In particular, claims data provide a valuable triage point with rich information on a large number of errors that caused serious harm. However, it also has limitations. First, litigated claims are the "tip of the iceberg" of all errors.⁵⁵ Whether that tip is representative of what lies beneath depends on the characteristic in question. Severe injuries are certainly overrepresented, factors involving communication breakdowns may

be also, as might procedural breakdowns that are easily observed by patients. Despite these biases, we know of no reason why the causal patterns associated with errors that lead to litigation would differ from the causal patterns associated with their nonlitigated counterparts. Nonetheless, generalizability beyond the serious injuries observed in malpractice claims is uncertain.

Second, certain contributing factors may not have been detectable through claims file review even though they played a role; fatigue and workload are particularly likely to have gone undocumented, unless they formed part of the plaintiff's allegation. Consequently, the prevalence estimates for such factors represent lower bounds, and the multifactorial causality we observed probably understates the true complexity. In addition, our review could not prioritize the relative contributions of contributing factors to the adverse events nor disentangle causal relationships among factors. Third, because we examined events that predated the 2003 ACGME duty-hour regulation, we cannot evaluate its effect on trainee errors.

Finally, the reviewers' judgments about the appropriateness of care are likely to have been influenced by hindsight bias. One possible version of this bias is the knowledge of the litigation outcome, which may have encouraged findings of errors in paid claims and vice versa. Another version relates to the presence of adverse outcomes, especially severe ones, which may have prompted inferences that care was inappropriate.

Aside from some attention to handoff errors among house staff, trainee errors have gone largely unstudied. The causal characteristics we detected in malpractice claims data suggest special vulnerabilities around teamwork, multiple levels of supervision, and diagnostic decision making. Our findings should help leaders of residency programs and the ACGME to orient training interventions toward these problem areas and also stimulate further research into why and how trainee errors occur.

Accepted for Publication: March 29, 2007.

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and Studdert. *Analysis and interpretation of data:* Singh, Thomas, Petersen, and Studdert. *Drafting of the manuscript:* Singh and Studdert. *Critical revision of the manuscript for important intellectual content:* Singh, Thomas, and Petersen. *Obtained funding:* Thomas, Petersen, and Studdert. *Administrative, technical, and material support:* Singh, Petersen, and Studdert. *Study supervision:* Thomas, Petersen, and Studdert.

Financial Disclosure: None reported.

Funding/Support: This study was supported by grants from the Agency for Healthcare Research and Quality (grant HS011886-03) and the Harvard Risk Management Foundation. Dr Studdert was supported by the Agency for Healthcare Research and Quality (grant KO2HS11285). Dr Singh is a recipient of grant K23CA125585 from the National Cancer Institute and was also supported in part by resources and facilities at the 2 centers with which he is affiliated. Dr Thomas is supported by grant 1PO1HS1154401 from the Agency for Healthcare Research and Quality. Dr Petersen was a Robert Wood Johnson Foundation Generalist Physician Faculty Scholar (grant 045444) at the time this work was completed and is a recipient of the American Heart Association Established Investigator Award (grant 0540043N).

Role of the Sponsors: The sponsors of the study had no role in design and conduct of the study; collection, management, analysis, and interpretation of the data; and preparation, review, or approval of the manuscript or the decision to submit the manuscript for publication.

Disclaimer: The views expressed in this article are those of the authors and do not necessarily represent the views of the National Cancer Institute, the National Institutes of Health, or the Department of Veterans Affairs.

Previous Presentation: A part of the manuscript results were presented as an abstract at the annual meeting of the Society of General Internal Medicine; April 27, 2007; Toronto, Ontario, Canada.

REFERENCES

1. Kachalia A, Studdert DM. Professional liability issues in graduate medical education. *JAMA*. 2004;292(9):1051-1056.
2. Russell J, Sklar D, Bagian J, et al. *Patient Safety and Graduate Medical Education*. Washington, DC: Association of American Medical Colleges; 2003. Report No. 1.
3. Volpp KG, Grande D. Residents' suggestions for reducing errors in teaching hospitals. *N Engl J Med*. 2003;348(9):851-855.
4. Gawande AA, Zinner MJ, Studdert DM, Brennan TA. Analysis of errors reported by surgeons at three teaching hospitals. *Surgery*. 2003;133(6):614-621.
5. Shaughnessy AF, Nickel RO. Prescription-writing patterns and errors in a family medicine residency program. *J Fam Pract*. 1989;29(3):290-295.
6. Wray NP, Friedland JA. Detection and correction of house staff error in physical diagnosis. *JAMA*. 1983;249(8):1035-1037.
7. Cohn KH. Misadventures in surgical residency: analysis of mistakes during training. *Curr Surg*. 1985;42(4):278-285.
8. Jagsi R, Kitch BT, Weinstein DF, Campbell EG, Hutter M, Weissman JS. Residents report on adverse events and their causes. *Arch Intern Med*. 2005;165(22):2607-2613.
9. Wu AW, Folkman S, McPhee SJ, Lo B. Do house officers learn from their mistakes? *JAMA*. 1991;265(16):2089-2094.
10. Gratton MC, Salomone JA III, Watson WA. Clinically significant radiograph misinterpretations at an emergency medicine residency program. *Ann Emerg Med*. 1990;19(5):497-502.
11. Battles JB, Shea CE. A system of analyzing medical errors to improve GME curricula and programs. *Acad Med*. 2001;76(2):125-133.
12. Studdert DM, Mello MM, Gawande AA, et al. Claims, errors, and compensation

- payments in medical malpractice litigation. *N Engl J Med*. 2006;354(19):2024-2033.
13. Petersen LA, Brennan TA, O'Neil AC, Cook EF, Lee TH. Does housestaff discontinuity of care increase the risk for preventable adverse events? *Ann Intern Med*. 1994;121(11):866-872.
 14. Sexton JB, Thomas EJ, Helmreich RL. Error, stress, and teamwork in medicine and aviation: cross sectional surveys. *BMJ*. 2000;320(7237):745-749.
 15. Weiler PC, Hiatt HH, Newhouse JP, Johnson WG, Brennan T, Leape LL. *A Measure of Malpractice: Medical Injury, Malpractice Litigation, and Patient Compensation*. Cambridge, MA: Harvard University Press; 1993.
 16. Studdert DM, Brennan TA, Thomas EJ. Beyond dead reckoning: measures of medical injury burden, malpractice litigation, and alternative compensation models from Utah and Colorado. *Indiana L Rev*. 2000;33(4):1643-1686.
 17. National Practitioner Data Bank. Public use data files. Healthcare Integrity and Protection Data Bank Web site. <http://www.npdb-hipdb.hrsa.gov/publicdata.html>. Accessed August 6, 2007.
 18. Chandra A, Nundy S, Seabury SA. The growth of physician medical malpractice payments: evidence from the National Practitioner Data Bank. *Health Aff (Millwood)*. January-June 2005(suppl Web exclusives):W5-240-W5-249.
 19. Gandhi TK, Kachalia A, Thomas EJ, et al. Missed and delayed diagnoses in the ambulatory setting: a study of closed malpractice claims. *Ann Intern Med*. 2006;145(7):488-496.
 20. National Association of Insurance Commissioners. *National Association of Insurance Commissioners, Malpractice Claims: Final Compilation*. Brookfield, WI: National Association of Insurance Commissioners; 1980.
 21. Institute of Medicine. *To Err Is Human: Building a Safer Health System*. Washington, DC: Institute of Medicine; 2000:28.
 22. Thomas EJ, Studdert DM, Burstin HR, et al. Incidence and types of adverse events and negligent care in Utah and Colorado in 1992. *Med Care*. 2000;38(3):261-271.
 23. Brennan TA, Leape LL, Laird NM, et al. Incidence of adverse events and negligence in hospitalized patients: results of the Harvard Medical Practice Study I. *N Engl J Med*. 1991;324(6):370-376.
 24. Rogers SO Jr, Gawande AA, Kwaan M, et al. Analysis of surgical errors in closed malpractice claims at 4 liability insurers. *Surgery*. 2006;140(1):25-33.
 25. Baker DP, Gustafson S, Beaubien J, Salas E, Barach P. Medical teamwork and patient safety: The evidence-based relation. Rockville, MD: Agency for Healthcare Research and Quality; April 2005. Publication No. 05-0053. <http://www.ahrq.gov/qual/medteam>. Accessed July 13, 2006.
 26. Royal Pharmaceutical Society of Great Britain and the British Medical Association. *Teamworking in Primary Healthcare: Realising Shared Aims in Patient Care*. London, England: Royal Pharmaceutical Society of Great Britain and the British Medical Association; 2005.
 27. Summary report for 29-1062.00—Family and General Practitioners. O*NET On-Line. Occupational Information Network. 2006. <http://online.onetcenter.org/link/summary/29-1062.00>. Accessed October 3, 2006.
 28. Sutcliffe KM, Lewton E, Rosenthal MM. Communication failures: an insidious contributor to medical mishaps. *Acad Med*. 2004;79(2):186-194.
 29. Arora V, Johnson J, Lovinger D, Humphrey HJ, Meltzer DO. Communication failures in patient sign-out and suggestions for improvement: a critical incident analysis. *Qual Saf Health Care*. 2005;14(6):401-407.
 30. Solet DJ, Norvell JM, Rutan GH, Frankel RM. Lost in translation: challenges and opportunities in physician-to-physician communication during patient handoffs. *Acad Med*. 2005;80(12):1094-1099.
 31. Landrigan CP, Rothschild JM, Cronin JW, et al. Effect of reducing interns' work hours on serious medical errors in intensive care units. *N Engl J Med*. 2004;351(18):1838-1848.
 32. Risser DT, Rice MM, Salisbury ML, Simon R, Jay GD, Berns SD; The MedTeams Research Consortium. The potential for improved teamwork to reduce medical errors in the emergency department. *Ann Emerg Med*. 1999;34(3):373-383.
 33. Thomas EJ, Sexton JB, Lasky RE, Helmreich RL, Crandell DS, Tyson J. Teamwork and quality during neonatal care in the delivery room. *J Perinatol*. 2006;26(3):163-169.
 34. Weinberger SE, Smith LG, Collier VU; Education Committee of the American College of Physicians. Redesigning training for internal medicine. *Ann Intern Med*. 2006;144(12):927-932.
 35. Lamb MP. Telephone precepting: the development of a curriculum. *Teach Learn Med*. 2004;16(3):276-278.
 36. Salas E, Wilson KA, Burke CS, Wightman DC. Does crew resource management training work? an update, an extension, and some critical needs. *Hum Factors*. 2006;48(2):392-412.
 37. Nielsen PE, Goldman MB, Mann S, et al. Effects of teamwork training on adverse outcomes and process of care in labor and delivery: a randomized controlled trial. *Obstet Gynecol*. 2007;109(1):48-55.
 38. Petersen LA, Orav EJ, Teich JM, O'Neil AC, Brennan TA. Using a computerized sign-out program to improve continuity of inpatient care and prevent adverse events. *Jt Comm J Qual Improv*. 1998;24(2):77-87.
 39. Feinstein ARM. System, supervision, standards, and the "epidemic" of negligent medical errors. *Arch Intern Med*. 1997;157(12):1285-1289.
 40. ACGME. ACGME resident review committee program requirements. 2006. <http://www.acgme.org/acWebsite/home/home.asp>. Accessed August 15, 2006.
 41. Kilminster SM, Jolly BC. Effective supervision in clinical practice settings: a literature review. *Med Educ*. 2000;34(10):827-840.
 42. Shojania KG, Fletcher KE, Saint S. Graduate medical education and patient safety: a busy—and occasionally hazardous—intersection. *Ann Intern Med*. 2006;145(8):592-598.
 43. Flynn T. Resident supervision. *ACGME Bulletin*. August 2005:15-17 http://www.va.gov/oa/Archive/ACGME_Bulletin09_05.pdf. Accessed October 3, 2006.
 44. Morrison EHM, Rucker LM, Boker JRP, et al. A pilot randomized, controlled trial of a longitudinal residents-as-teachers curriculum. *Acad Med*. 2003;78(7):722-729.
 45. Singh H, Thomas EJ, Khan M, Petersen LA. Identifying diagnostic errors in primary care using an electronic screening algorithm. *Arch Intern Med*. 2007;167(3):302-308.
 46. Graber ML, Franklin N, Gordon R. Diagnostic error in internal medicine. *Arch Intern Med*. 2005;165(13):1493-1499.
 47. Singh H, Arora HS, Vij MS, Rao R, Khan M, Petersen LA. Communication outcomes of critical imaging results in a computerized notification system. *J Am Med Assoc*. 2007;14(4):459-466.
 48. Graber M, Gordon R, Franklin N. Reducing diagnostic errors in medicine: what's the goal? *Acad Med*. 2002;77(10):981-992.
 49. Helmreich RL. On error management: lessons from aviation. *BMJ*. 2000;320(7237):781-785.
 50. Physician Insurers Association of America. PIAA research notes: primary care managers focus on internal medicine and general and family practice. Rockville, MD: Physician Insurers Association of America; 2002.
 51. Gaba DM, Howard SK, Fish KJ, Smith BE, Sowb YA. Simulation-based training in anesthesia crisis resource management (ACRM): a decade of experience. *Simul Gaming*. 2001;32(2):175-193.
 52. Gaba DM. The future vision of simulation in health care. *Qual Saf Health Care*. 2004;13(suppl 1):i2-i10.
 53. Bates DW, Gawande AA. Improving safety with information technology. *N Engl J Med*. 2003;348(25):2526-2534.
 54. Croskerry P. Cognitive forcing strategies in clinical decisionmaking. *Ann Emerg Med*. 2003;41(1):110-120.
 55. Thomas EJ, Petersen LA. Measuring errors and adverse events in health care. *J Gen Intern Med*. 2003;18(1):61-67.